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# A test-bed for joint climate prediction and services approach

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## What

Environmental forecasting

## Why

Our strength ...

... research ...

... operations ...

... services ...

... high resolution ...

## How

Develop a capability to model air quality processes from urban to global and the impacts on weather, health and ecosystems

Implement a climate prediction system for subseasonal-to-decadal climate prediction

Develop user-oriented services that favour both technology transfer and adaptation

Use cutting-edge HPC and Big Data technologies for the efficiency and user-friendliness of Earth system models

Earth system  
services

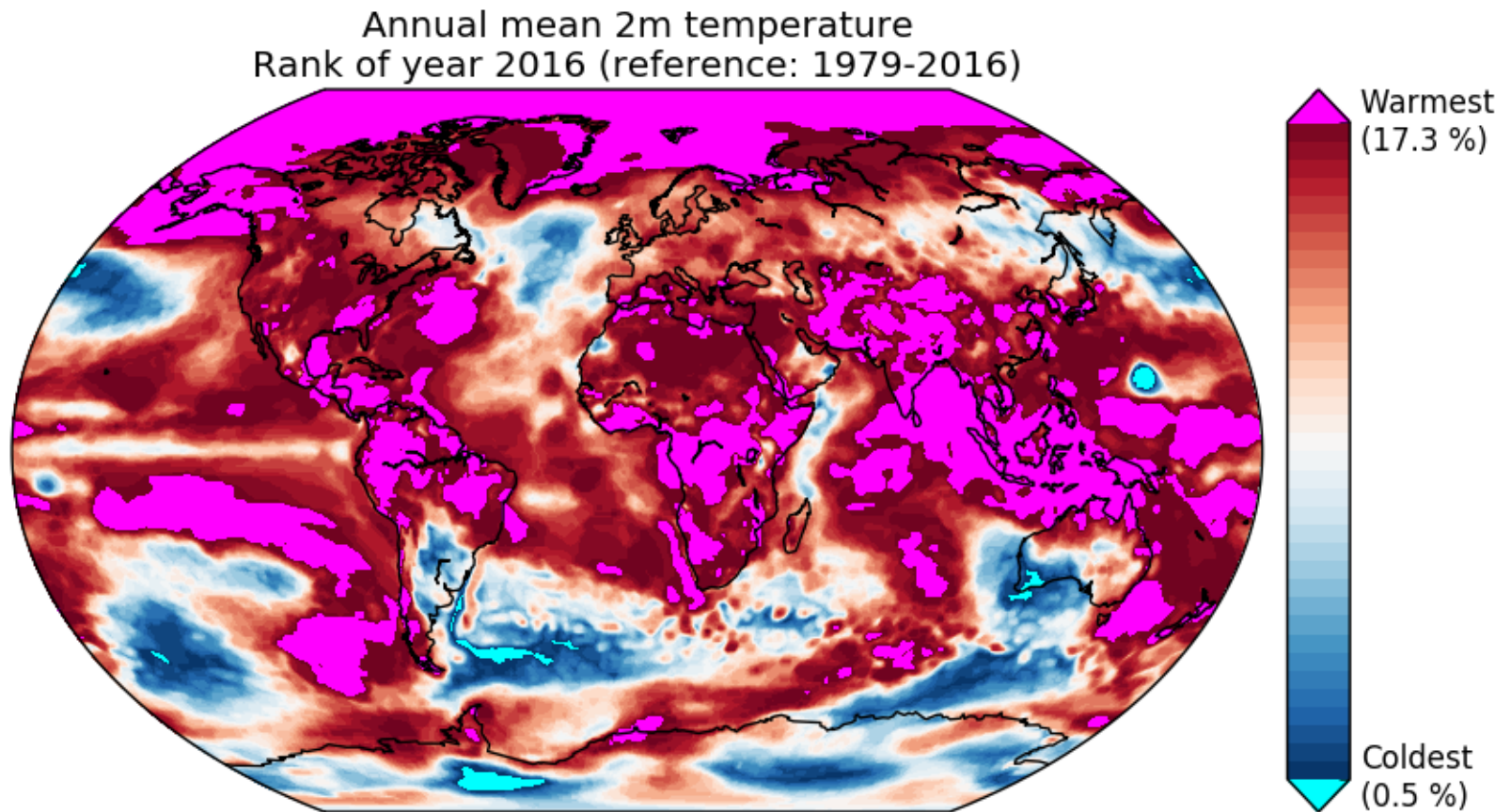
Climate  
prediction

Atmospheric  
composition

Computational  
Earth sciences

Ranking of the 2016 annual mean temperature over the last 37 years from ERA Interim.

**This is an example of the kind of signal that we expect to predict.**

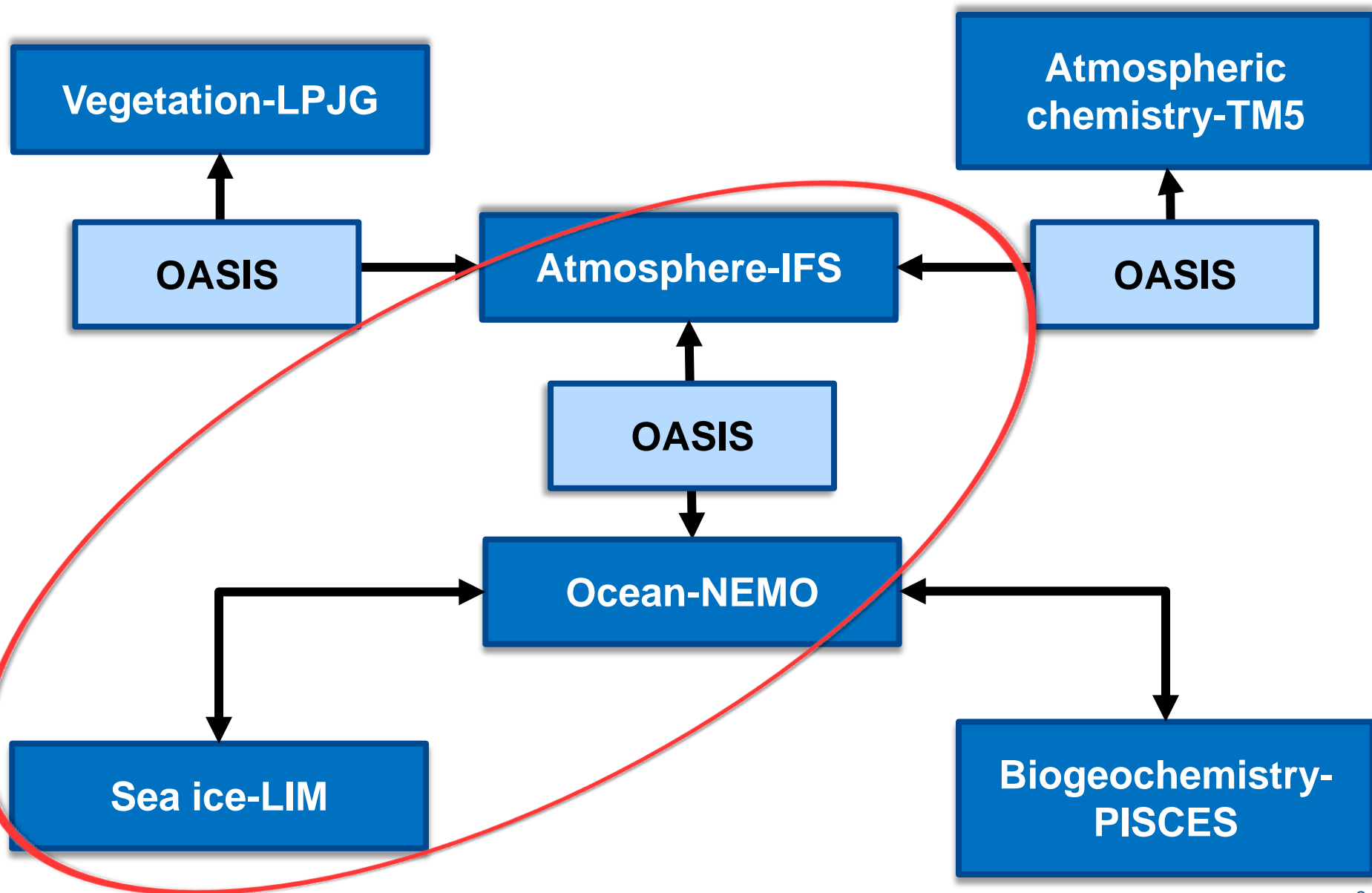


Data: ERA-Interim. Figure: F. Massonnet - BSC

# The EC-Earth Earth system model

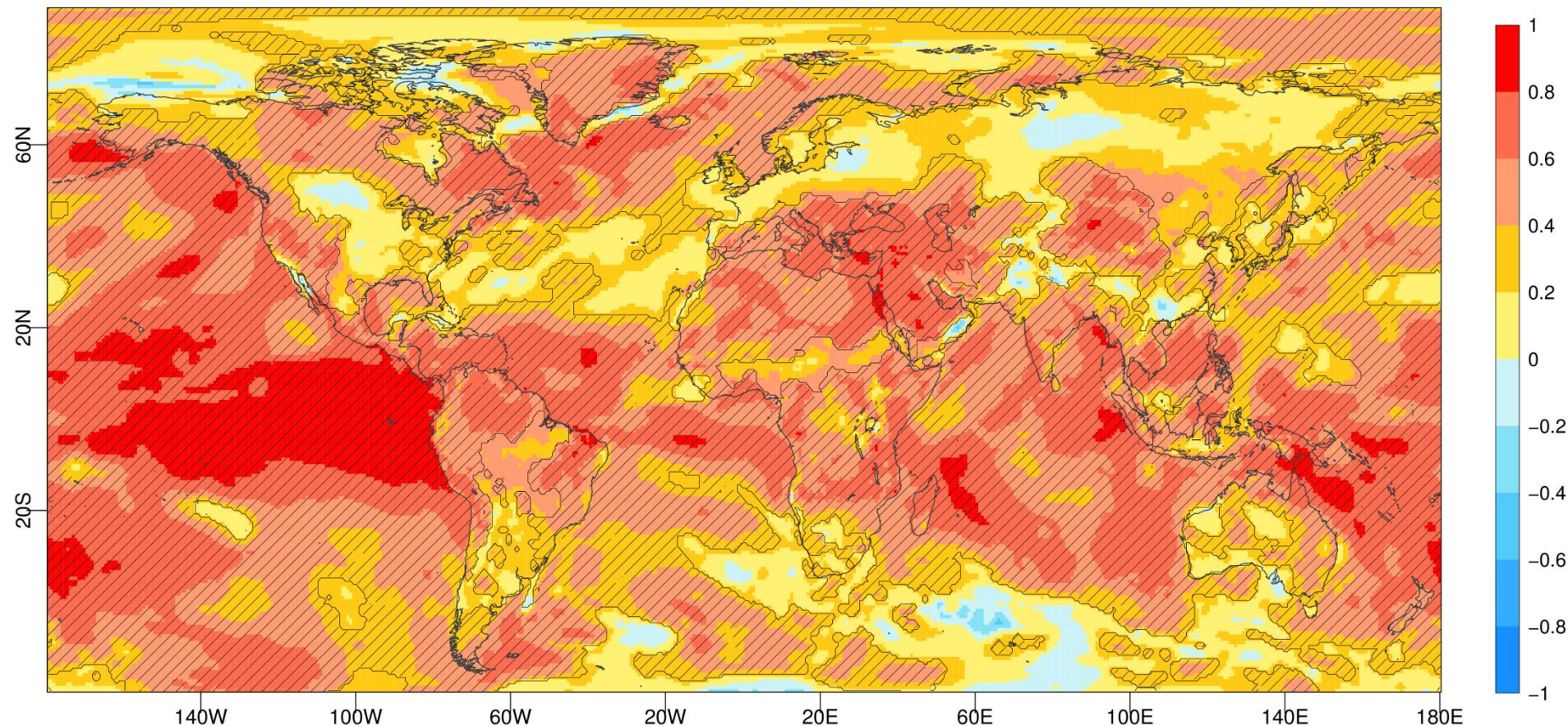


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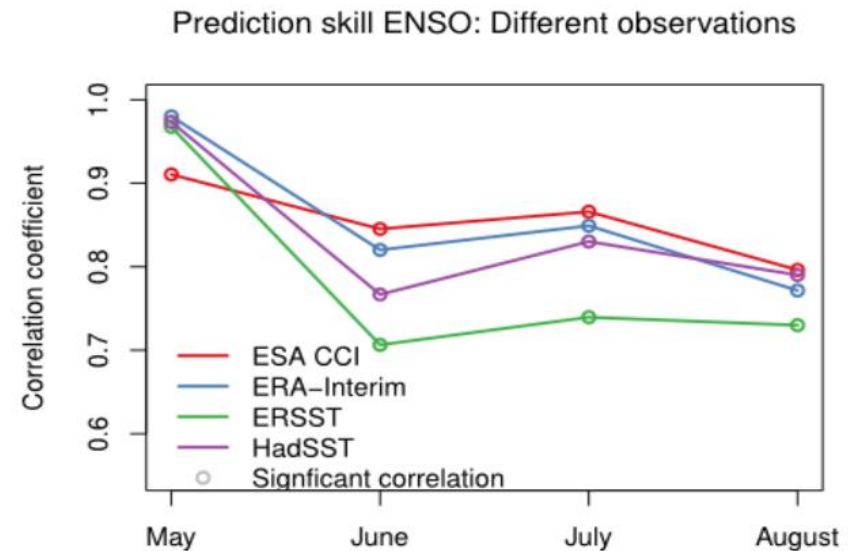
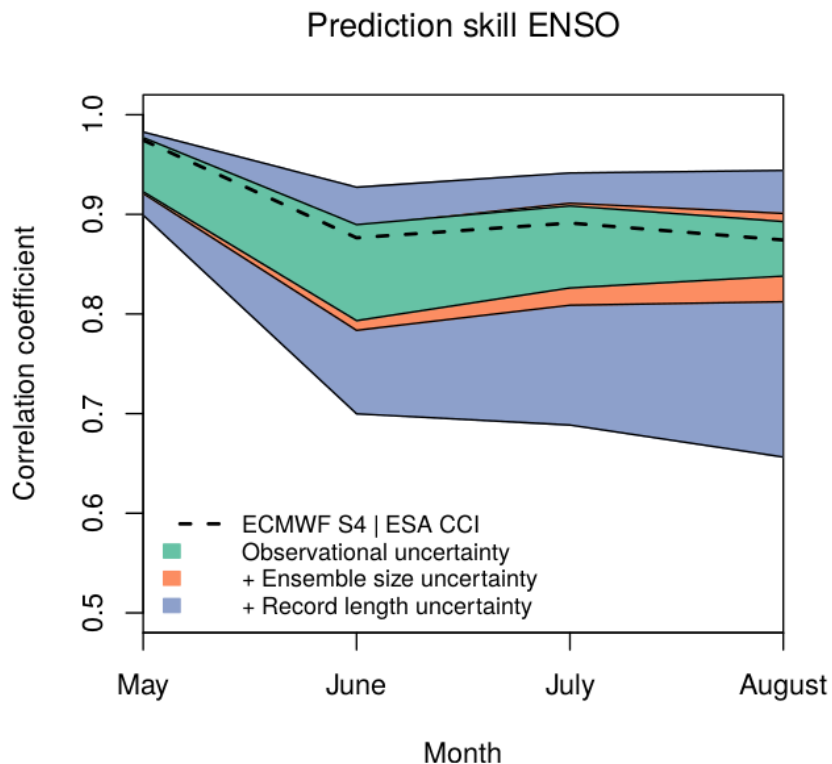




Correlation of the ensemble-mean prediction for the boreal summer (JJA) forecasts initialised on the first of May over 1981-2010. Hatched area for correlations statistically significant at the 95% confidence level.

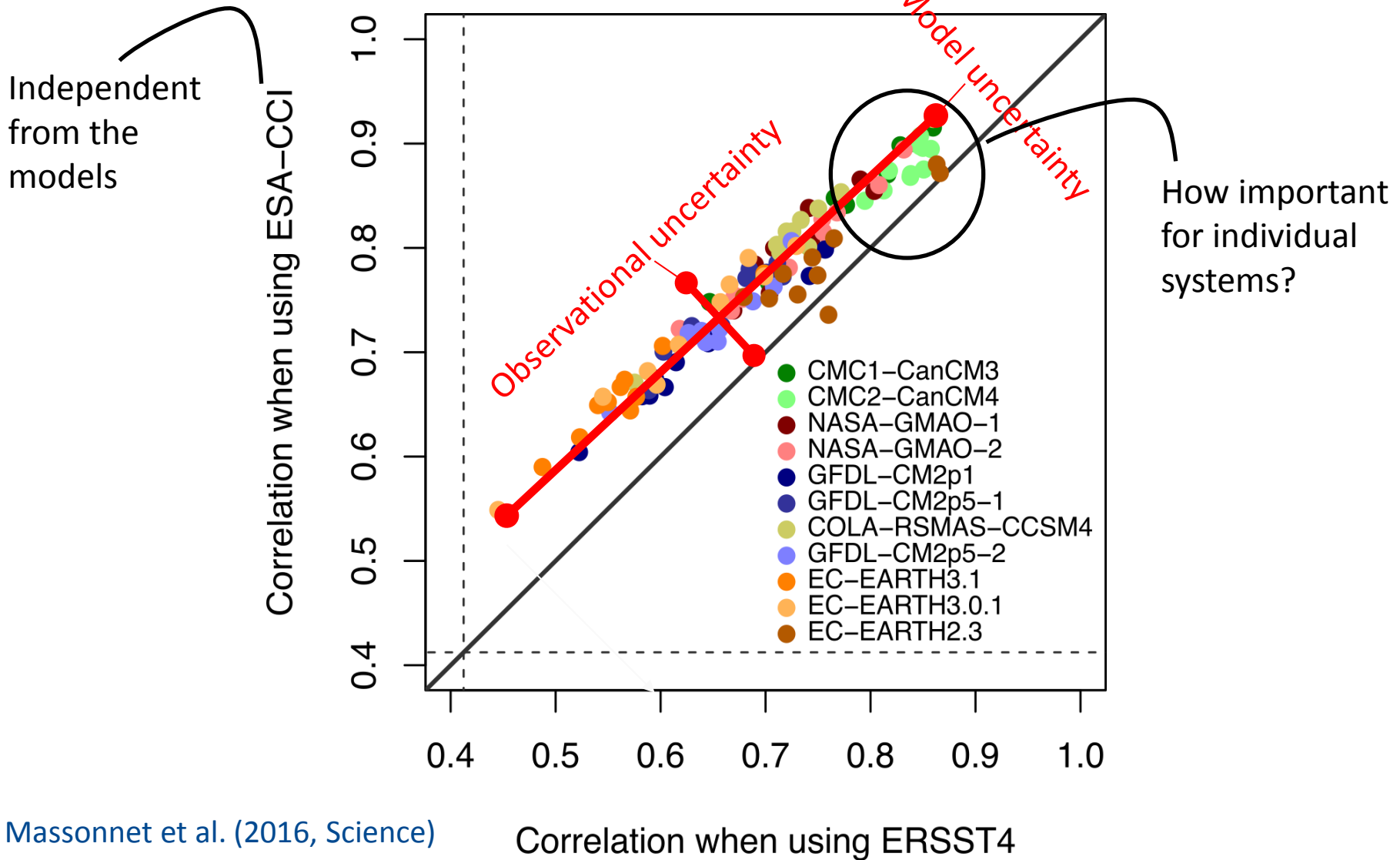


Niño 3.4 SST correlation of the ensemble mean for (right) EC-Earth3.1 (T511/ORCA025) predictions with ERAInt and GLORYS2v1 ics, and BSC sea-ice reconstruction and (left) ECMWF System 4, both started every May over 1993-2009.





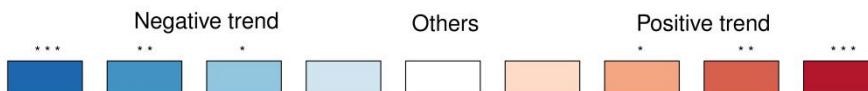
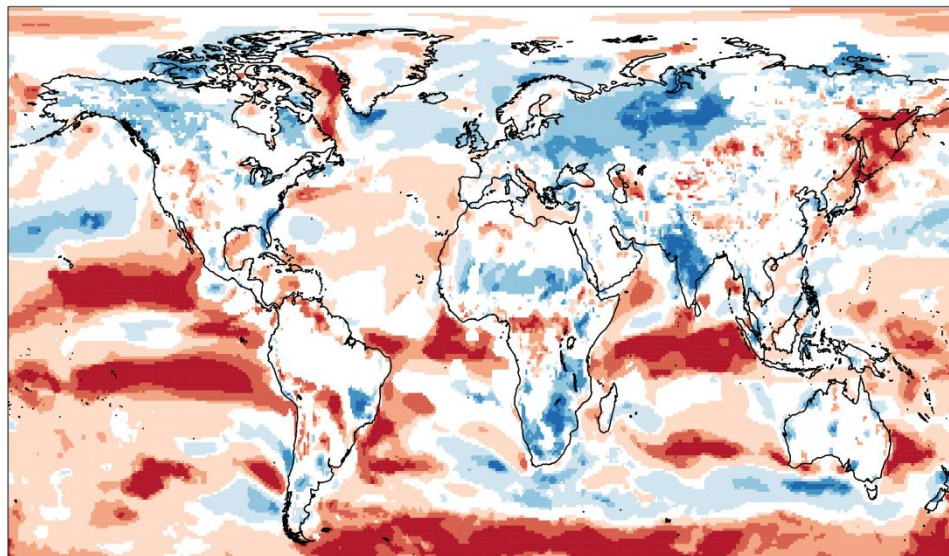
Models can also be used to estimate the quality of observational estimates.



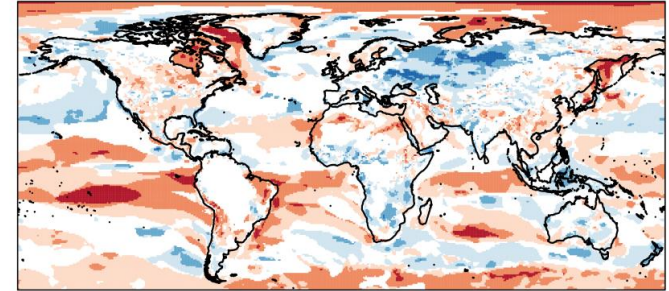
# Reference uncertainty: trends

(Bottom) Coherence of the 10-metre wind speed trends in three reanalyses (ERA-Interim, JRA-55 and MERRA) over 1981-2015 during boreal winter.

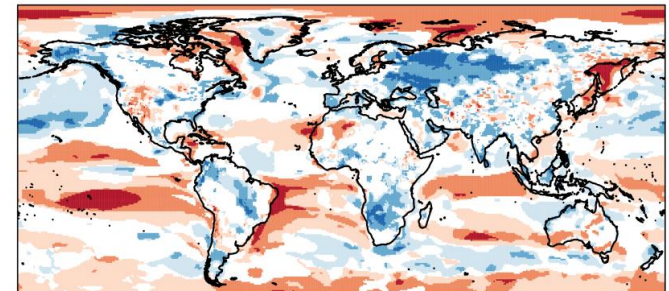
(Right) Coherence of the trends between ECMWF S4 and the three reanalyses.



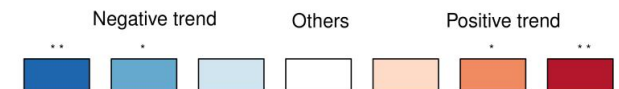
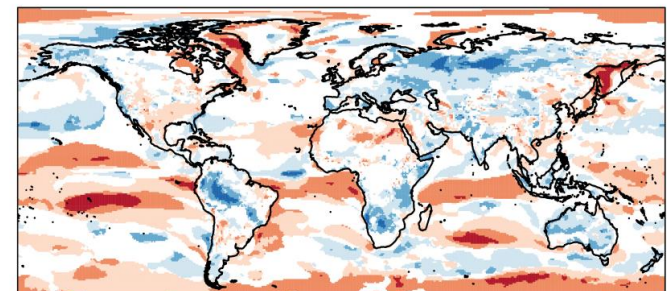
(a)ECMWF S4 – ERA-I



(b)ECMWF S4 – JRA-55



(c)ECMWF S4 – MERRA-2

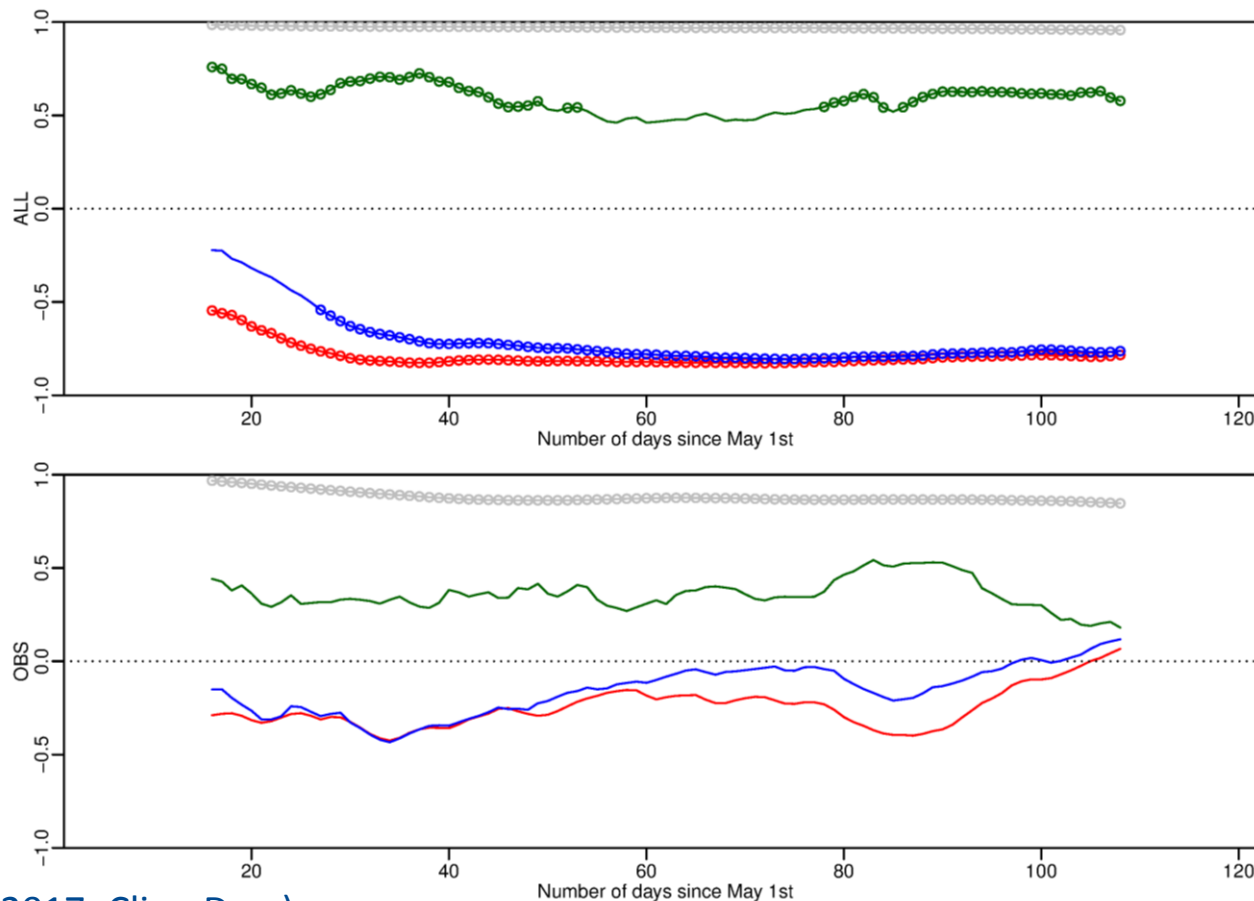




- The previous work is based on forecast and observed anomalies, without full consideration of the climate characteristics.
- Forecast anomalies are computed as differences from a model climatology. Observational reference anomalies use an observational climatology for the same period.
- The model climatology is different for each start date because the model drifts from the initial conditions based on observations towards the model stationary climate.
- In this context, systematic errors are a moving target.
- The characteristics of the drift depend on the variable considered and can be either very fast (SLP, days) or very slow (ocean salinity, decades).
- The stationary systematic errors (those analysed in the CMIP exercises) are not necessarily relevant for climate predictions.

Correlation between 1<sup>st</sup> of May total soil water content and 31-day running mean of variables from the SPECS multi-model seasonal forecast (top) and ERAInt (bottom) over North American Great Plains.

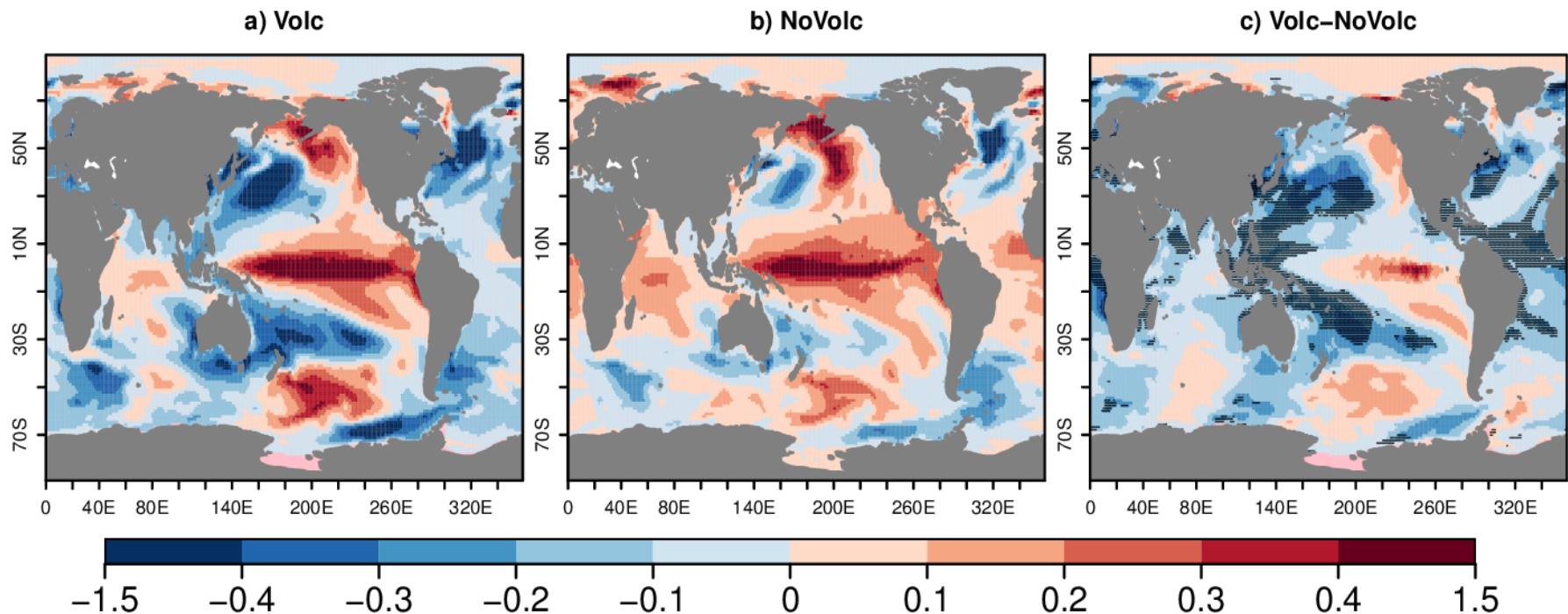
The model shifts quickly to excessive land-atmosphere coupling.



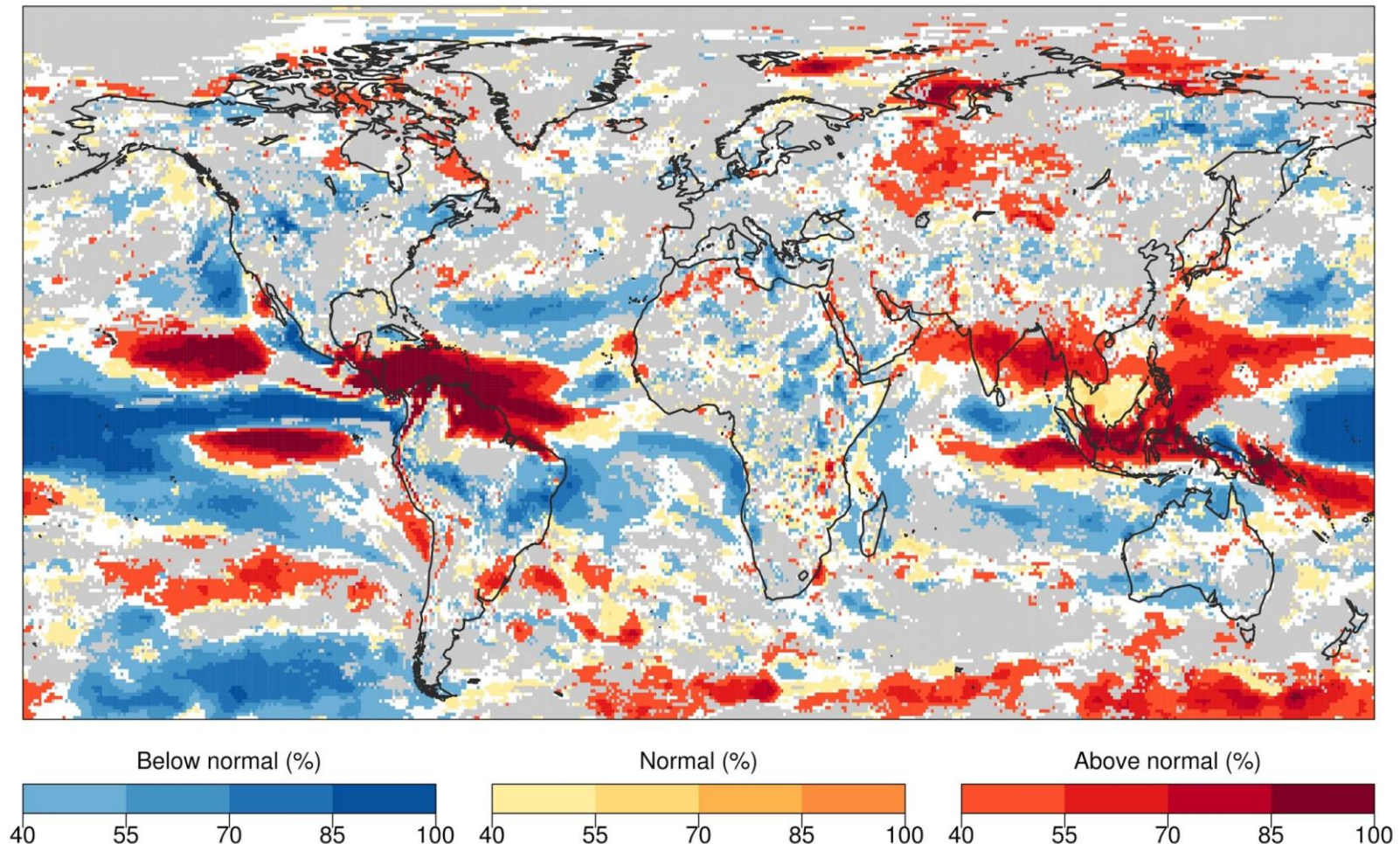
- Current climate predictions use CMIP-like forcings (GHG, aerosol, solar irradiance, etc.).
- Model sensitivity to the different forcings is not a trivial problem (link between trends and climate sensitivity).
- However, short-term forcings (aerosols, solar irradiance) need to be estimated somehow during the forecasts because CMIP forcings are either not operational and because forcings can undergo fast variations.
- CMIP6 DCP and VolMIP are addressing the issue for the volcanic aerosol forcing.



Mean SST anomaly (K) the first forecast year following the Agung (1963), El Chichon (1982) and Pinatubo (1991) eruptions in EC-Earth2.3 decadal hindcasts a) including the volcanic forcing (Volc), b) not including the volcanic forcing (NoVolc) and c) the difference (Volc-NoVolc). Stipling for differences statistically significant at 95% level.



# From ensembles to predictions



## Wind speed prediction for June 1st - August 31st 2015, issued on May 1st 2005.

The most likely wind power category (below normal, normal or above normal), and its percentage probability to occur is shown. "Normal" represents the average of the past. White areas show where the probability is <40% and approximately equal for all three categories. Grey areas show where the climate prediction model does not improve upon the standard and current approach, which projects past climate data into the future.



## SUCCESSFUL CLIMATE SERVICE Principles

Climate data is not climate information



EUPORIAS

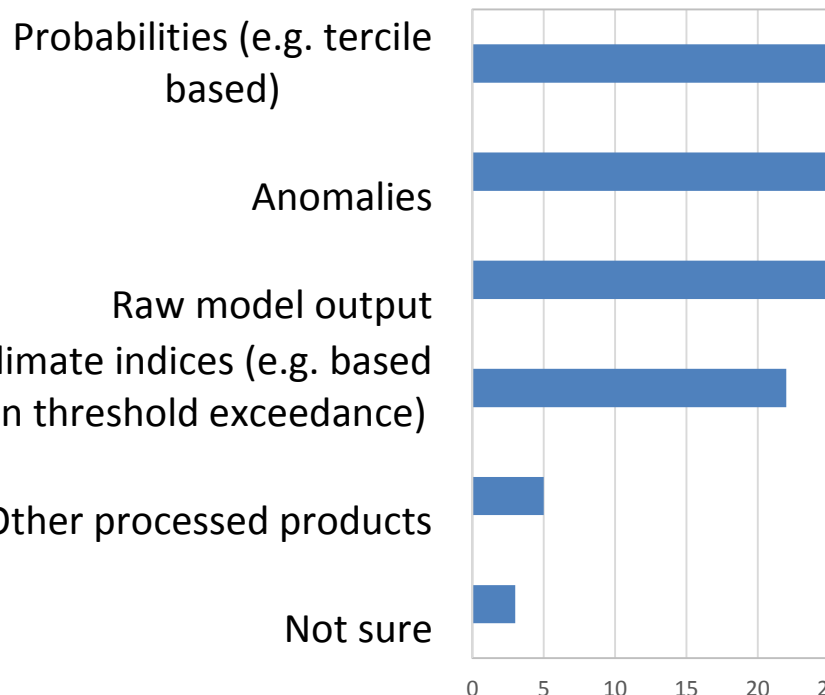


# What do the users want?

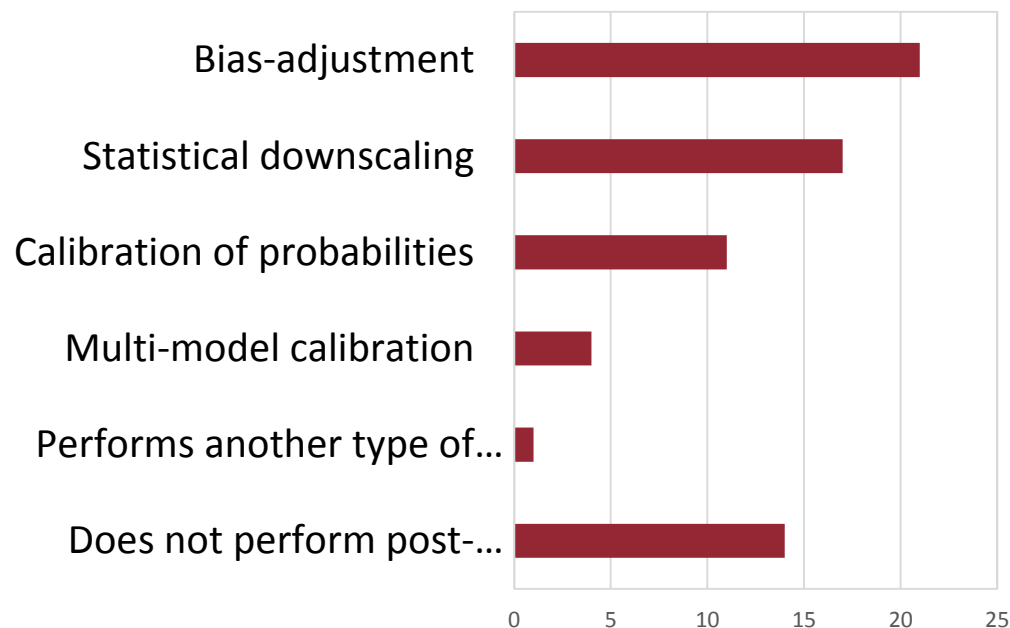


Results from a user survey performed in the framework of the Copernicus Climate Change Service contract QA4Seas.

## "What kind of data from global SF do you use?"

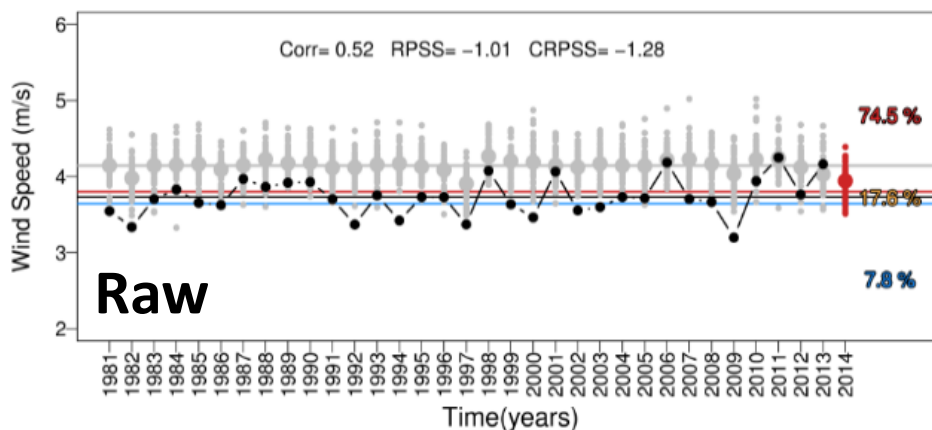
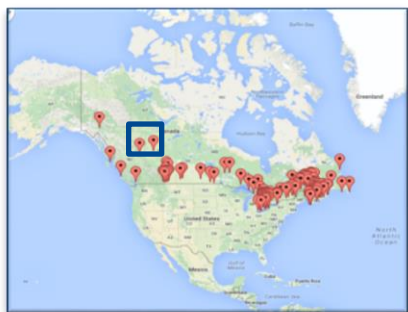


## "What type of adjustment post-processing do you perform on the SF data before using it?"



# Forecast adjustment

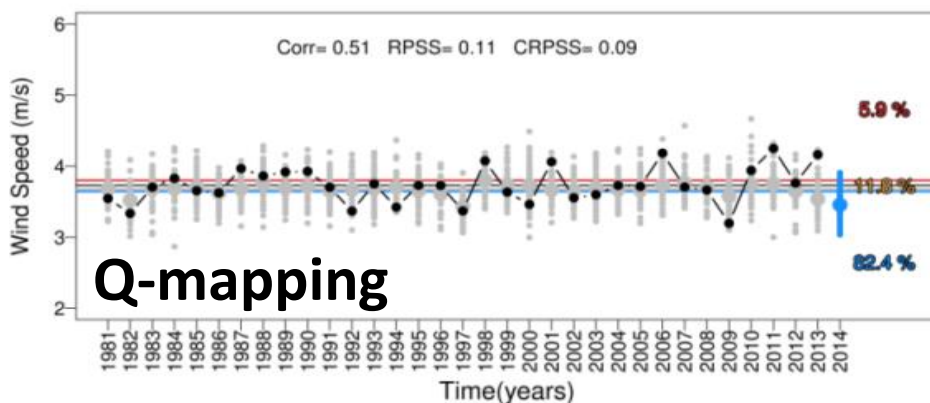
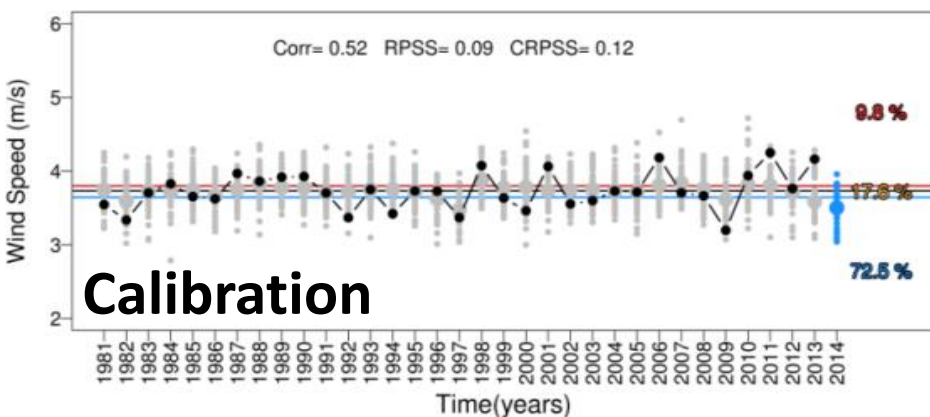
ECMWF S4 10-metre wind speed forecasts for DJF over 1981-2014;  
reference ERA-Interim.



Hindcast mean

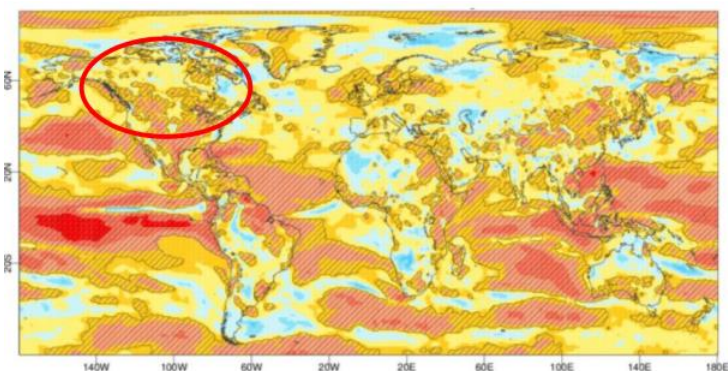
Mean bias

Obs mean

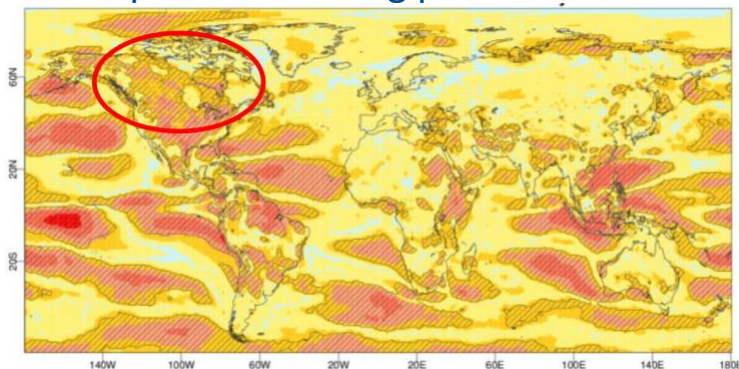


ECMWF S4 10-metre wind speed forecasts for DJF corrected with the predicted Niño3.4 index on a regression estimated using ERA-Interim.

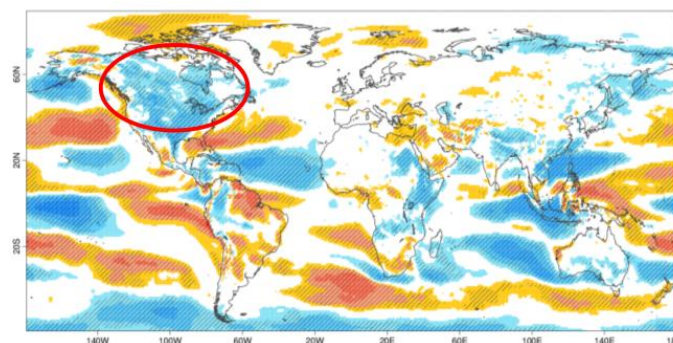
Correlation of the ECMWF S4 ensemble-mean prediction (1981-2015)



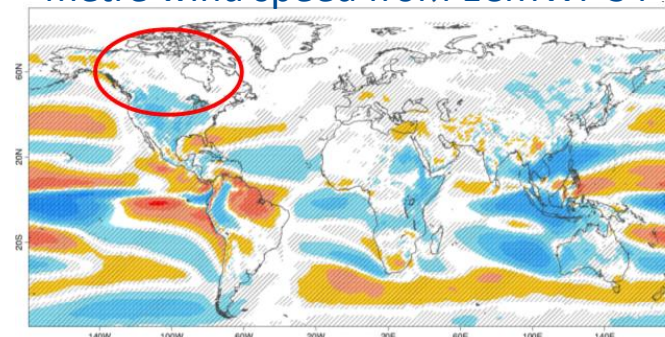
Correlation of the ECMWF S4 ensemble-mean prediction using predicted Niño3.4



Point correlation of Niño3.4 and 10-metre wind speed from ERA Interim



Point correlation of Niño3.4 and 10-metre wind speed from ECMWF S4





# Predicting tropical storm frequency



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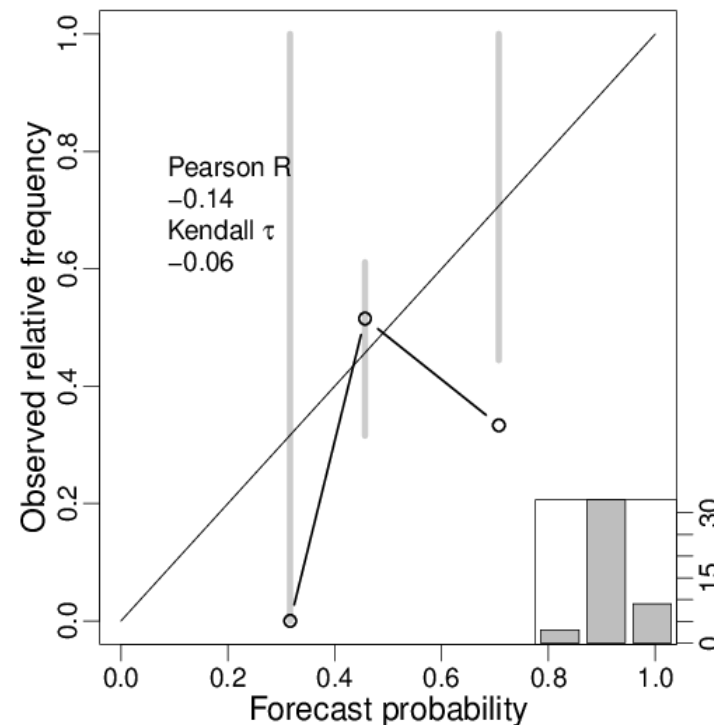
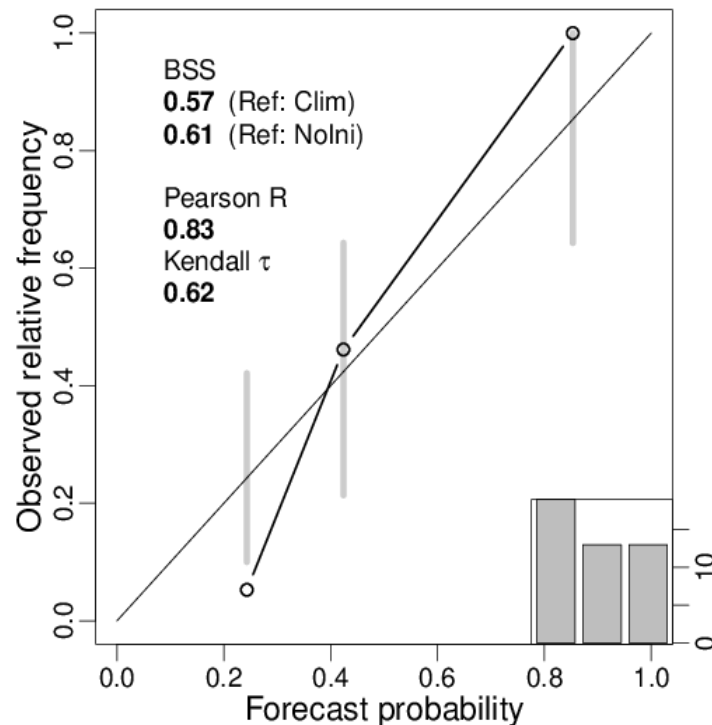
First comprehensive service of predictions of tropical cyclone seasonal frequency

<http://www.bsc.es/ESS/seasonalhurricanepredictions/>

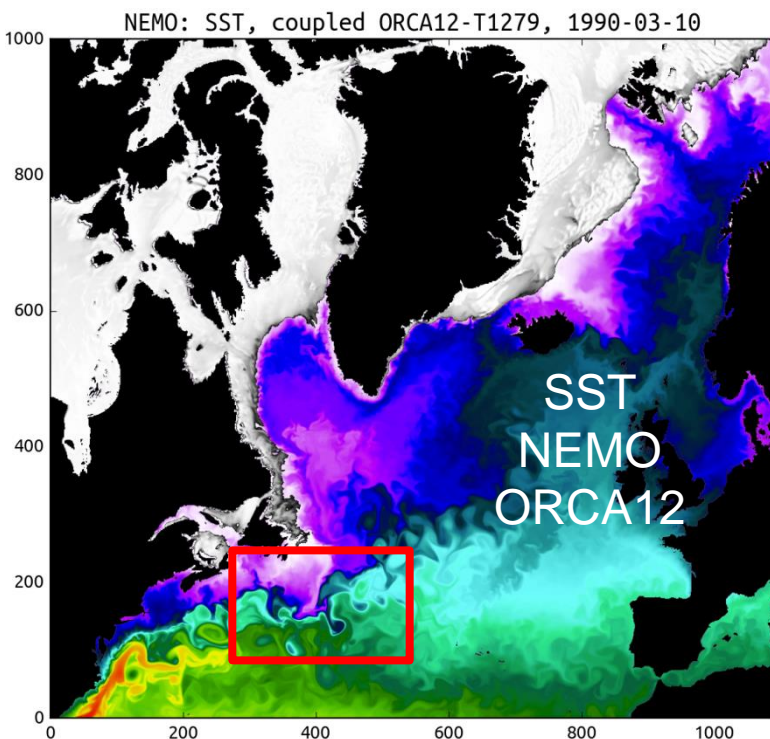


Reliability diagrams of (left) initialised and (right) uninitialised MME simulations for basin-wide **accumulated cyclone energy** (ACE). Results are for 2-9 year means above the climatological median from decadal predictions over 1961-2009. Statistically significant values in bold.

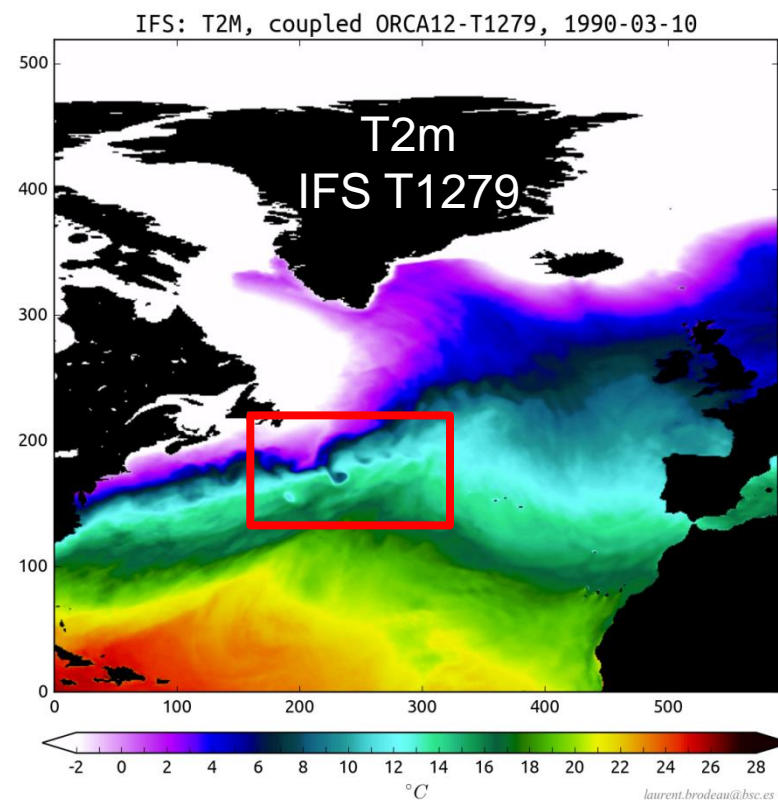
Some of the added value of the predictions is their better management of uncertainty, which leads to increased **credibility**.



- Improve the physical processes in the models.
- Improve the initialisation and illustrate its impact.
- Improve the post-processing.
- Use of multi-model.
- ...



## EC-Earth GLOBAL ORCA12-T1279 (ocean and atmosphere at ~10 km)

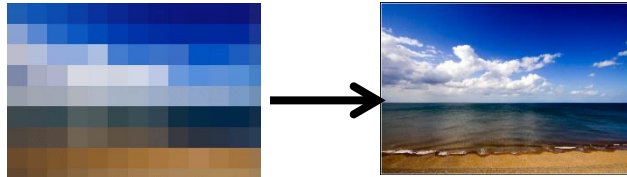




# Effect of increasing the resolution

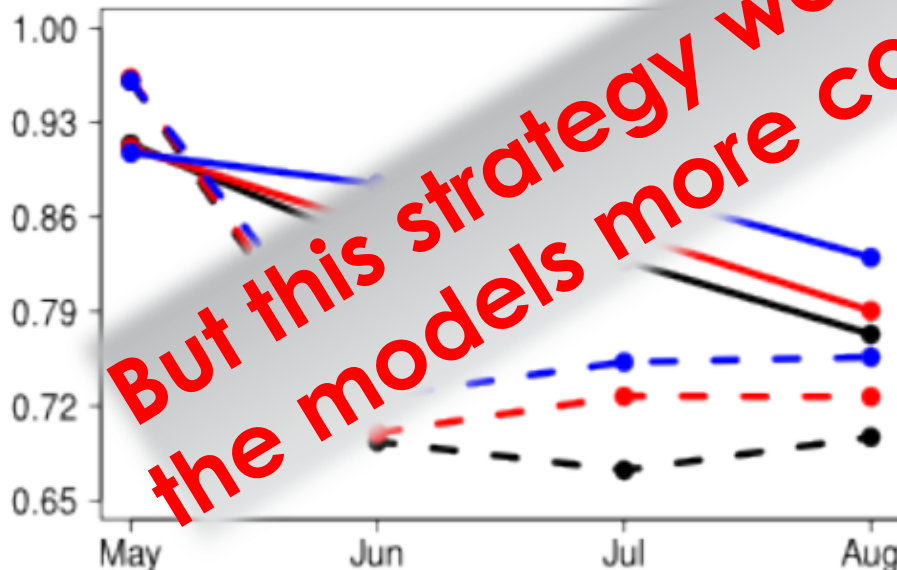


Forecast quality from EC-Earth3.1 seasonal hindcasts (1993-2009, Glorys2v1, ERAInt and ERALand initial conditions). Solid for ERA-Int and dashed for ERSST. Blue for high resolution ocean and atmosphere and black for standard resolution ocean, black for standard resolution.

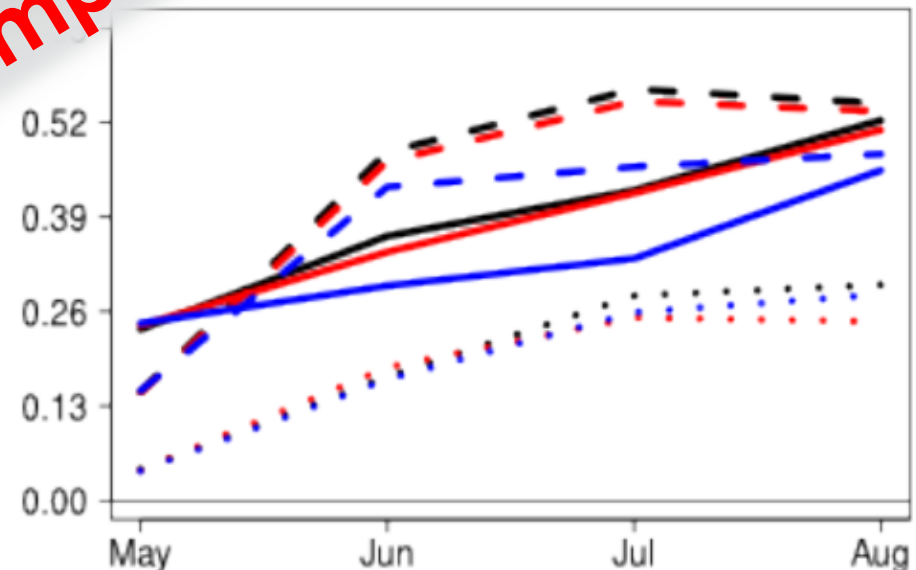


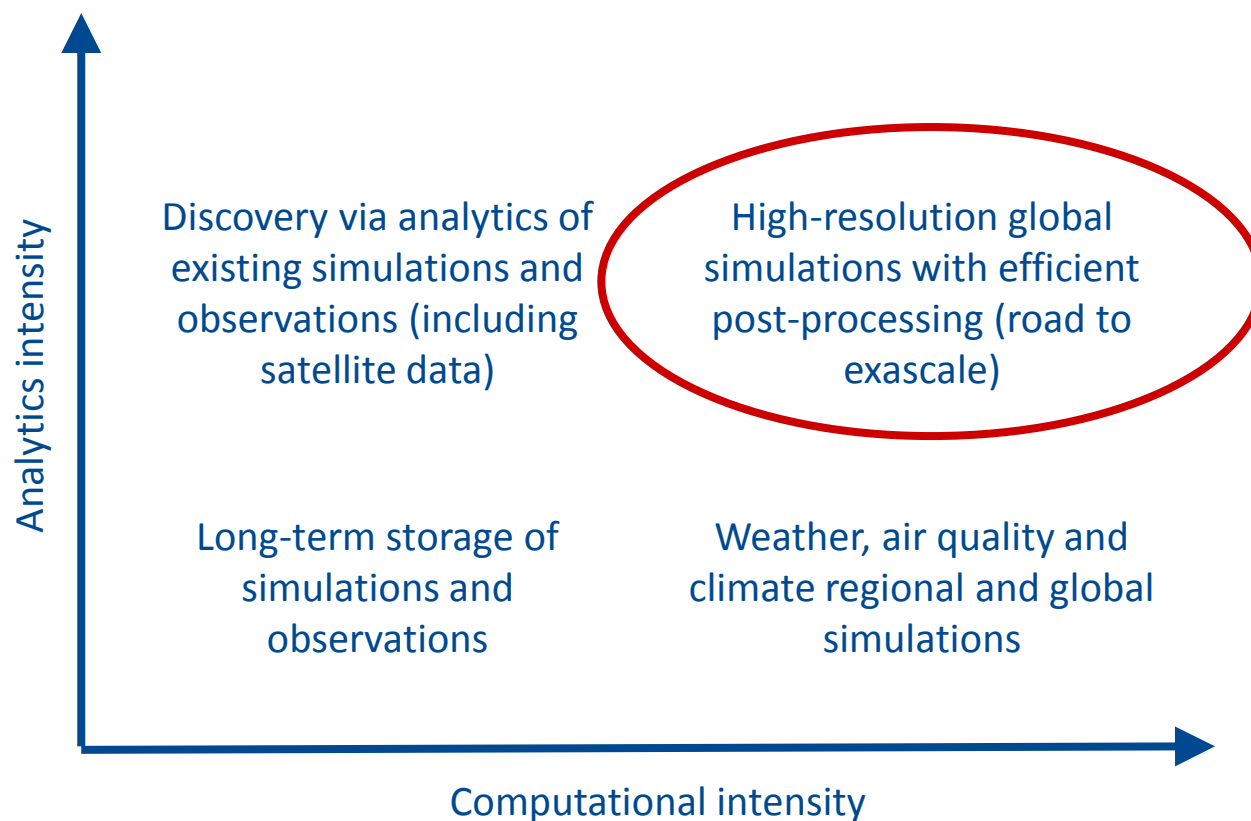
May st

a) Correlation



b) Spread and RMSE





# Improving model efficiency

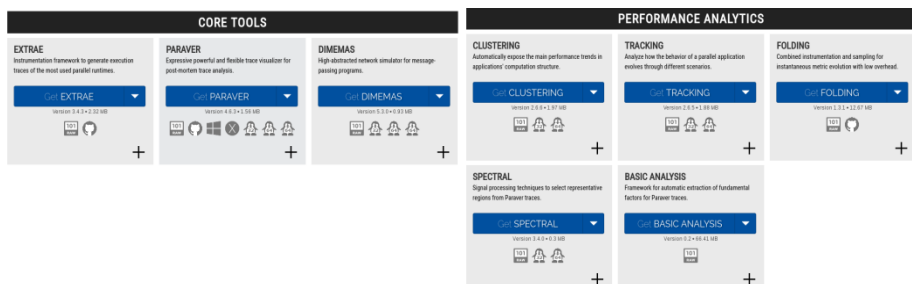


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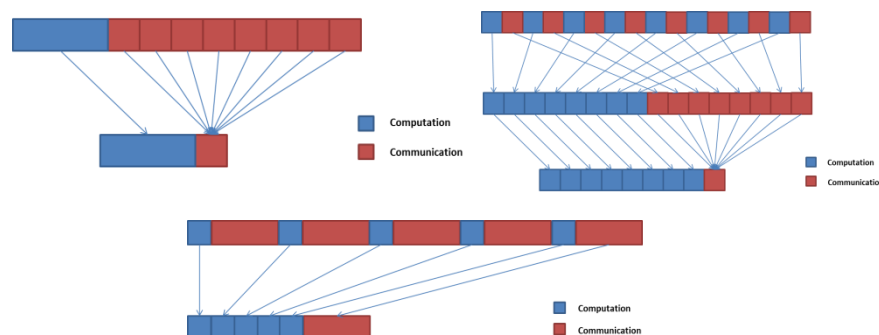
## Collaboration with computer sciences department

### BSC performance tools



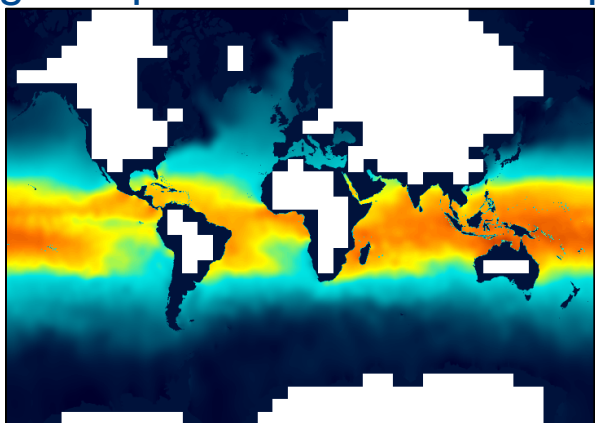
## MPI communications optimizations

### Reducing p2p and collective communications overhead



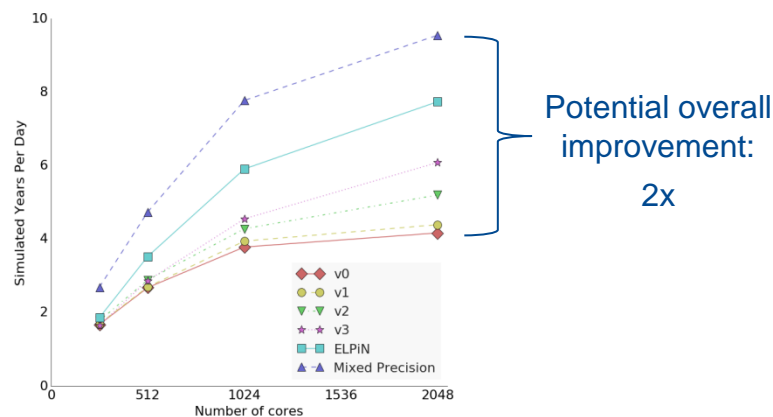
## Exclude land processes in NEMO

### Finding an optimal domain decomposition



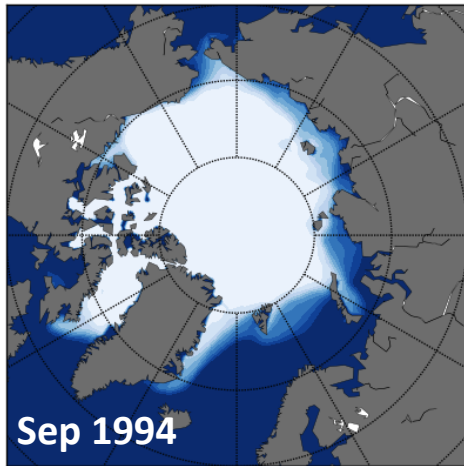
## Explore mixed precision

### Which precision is needed in NEMO?



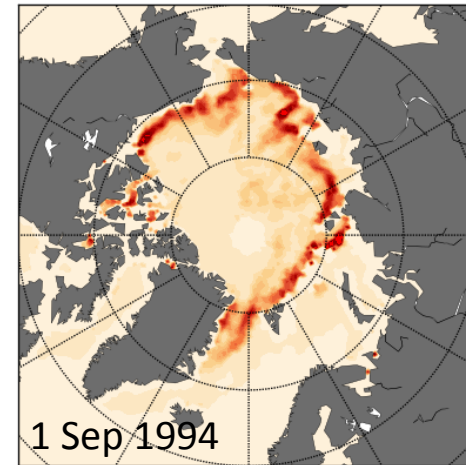
# Better sea-ice initial conditions

25-member EnKF analysis (one-month window) with EC-Earth3.2 where ESA-CCI concentration data are assimilated.

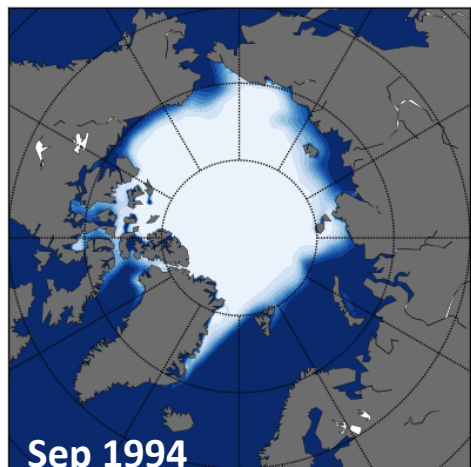
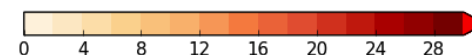


Free-running  
**EC-Earth3.2**

Ensemble  
mean SIC

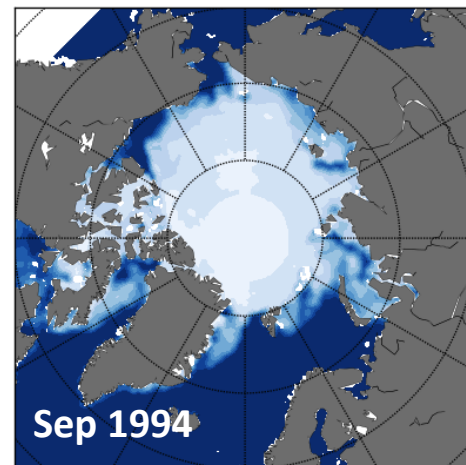


ESA CCI SIC  
uncertainty



**EnKF (SIC)**  
**EC-Earth3.2**

Ensemble  
mean SIC



NSIDC SIC





# Better land-surface initial conditions



JJA near-surface temperature correlation of the ensemble mean from experiments with a climatological (top) and difference with one with realistic (bottom) land-surface initialisation. Results for EC-Earth2.3 started in May over 1979-2010.

a) q90 of Tx

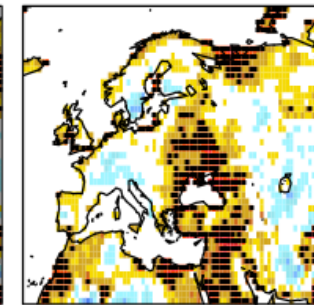
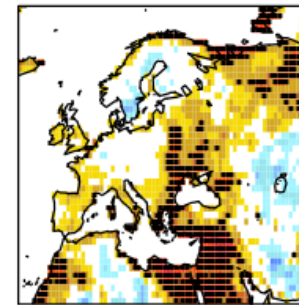
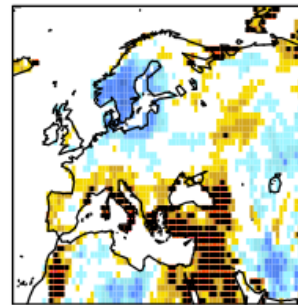
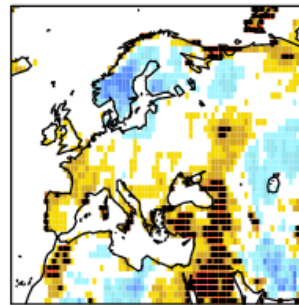
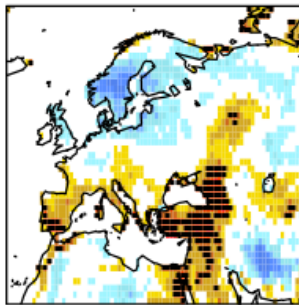
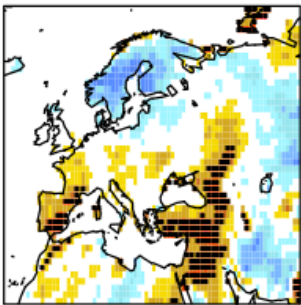
b) nb of warm days

c) q90 of Tn

d) nb of warm nights

e) q10 of Tn

f) nb of cold nights



g) q90 of Tx

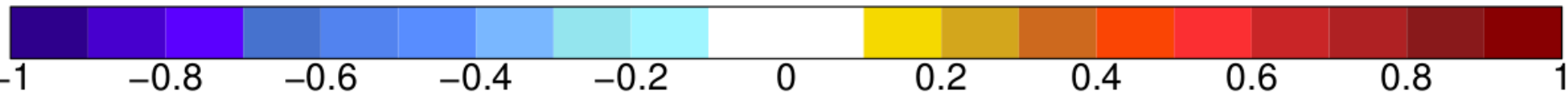
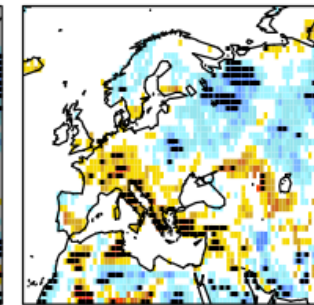
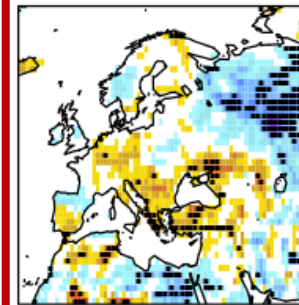
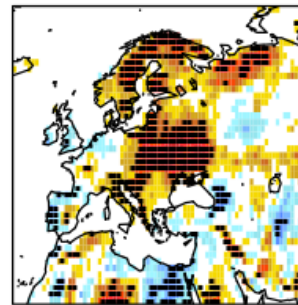
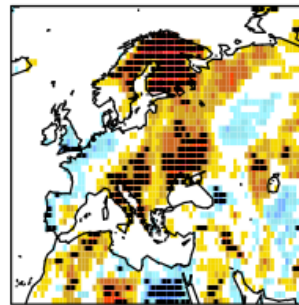
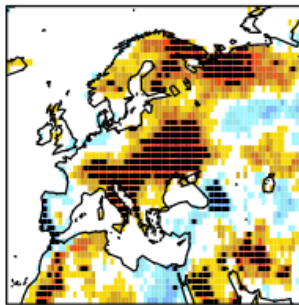
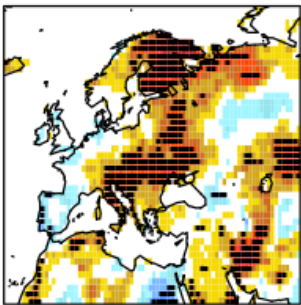
h) nb of warm days

i) q90 of Tn

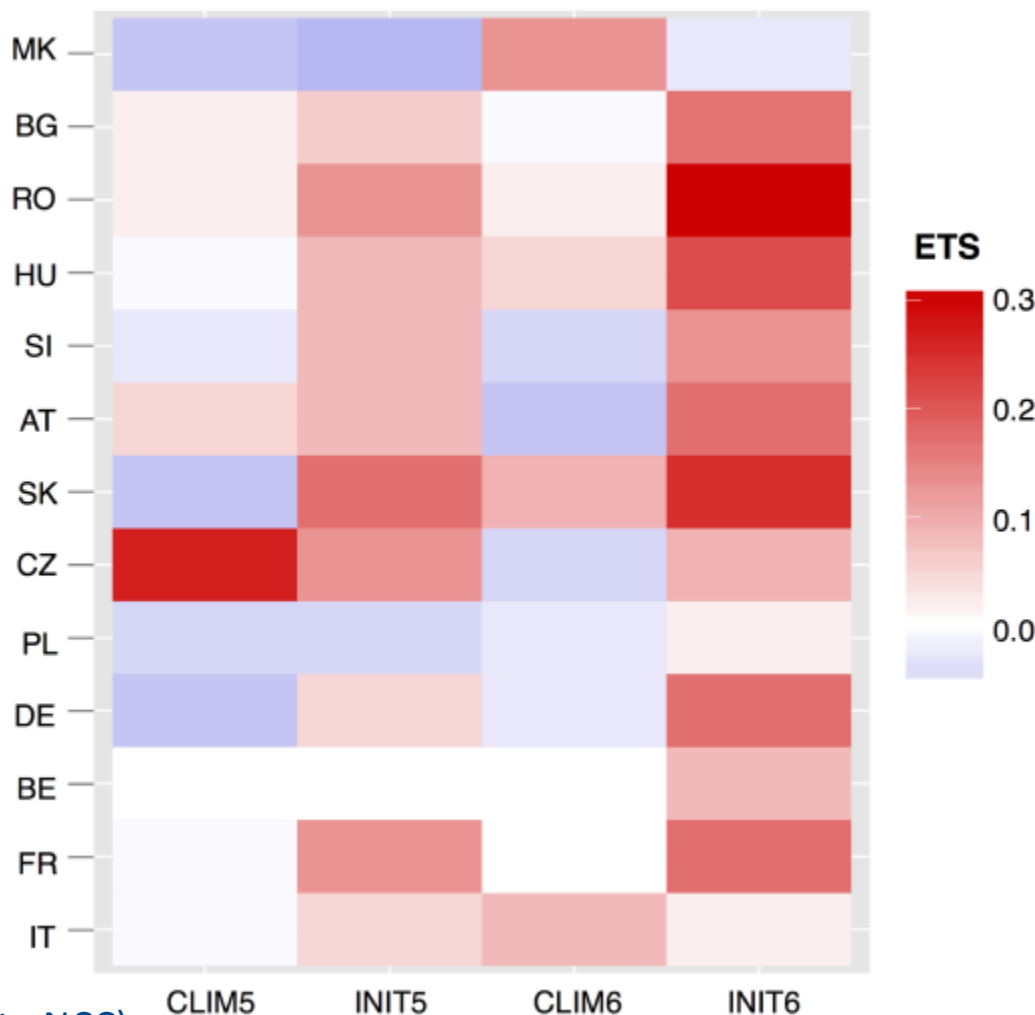
j) nb of warm nights

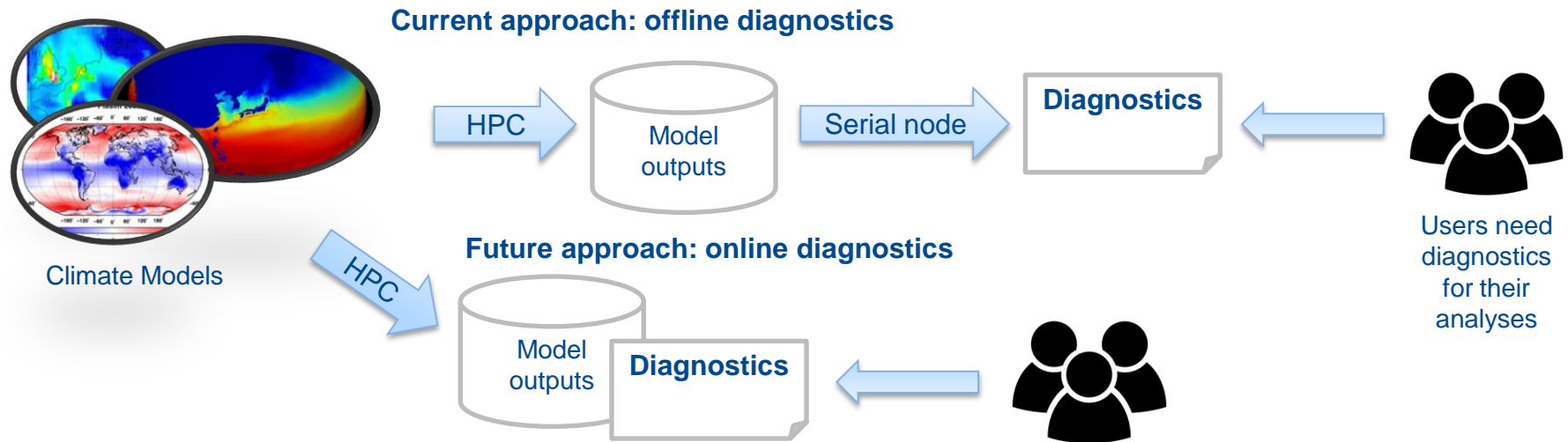
k) q10 of Tn

l) nb of cold nights



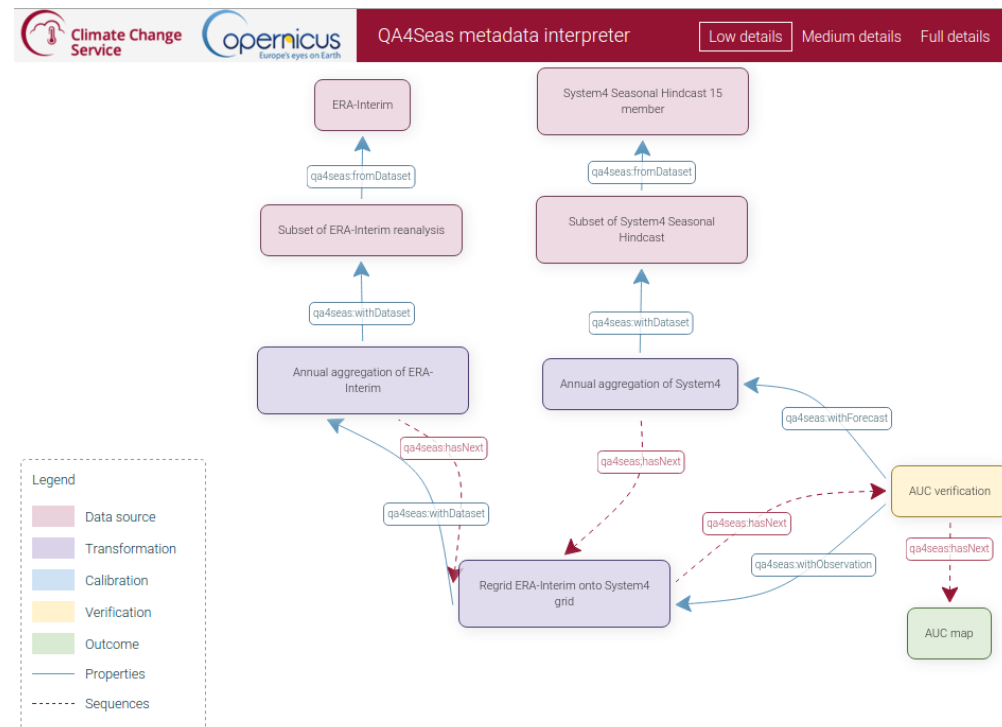
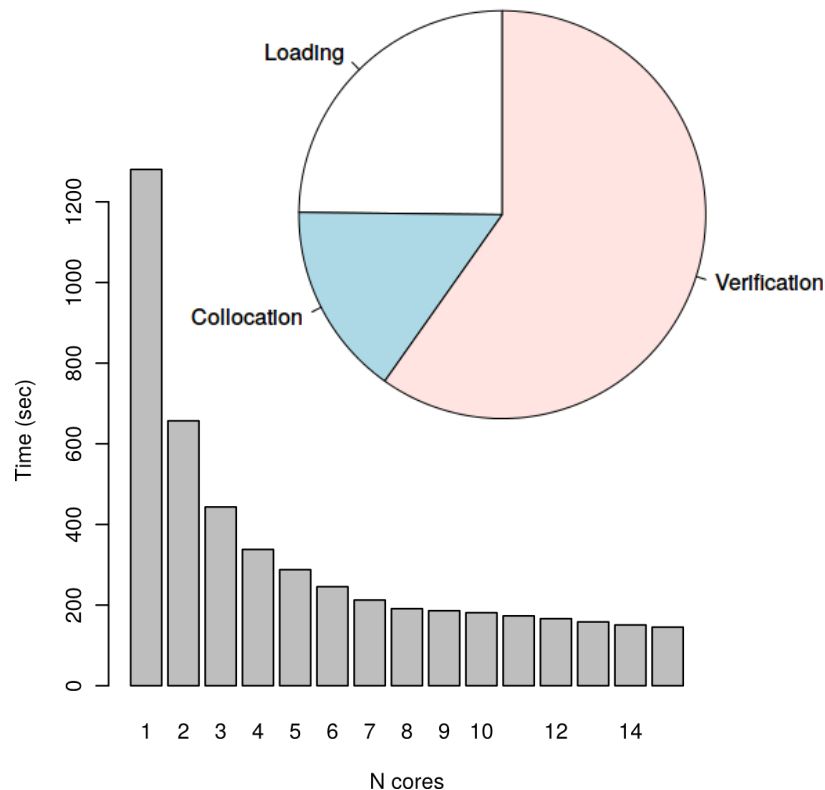
Equitable threat score (ETS) of predictions of poor maize yield (lower quartile) from EC-Earth seasonal predictions when land-surface is initialised with realistic initial conditions (INIT) wrt no information (CLIM).





- **Diagnostics computed as Analytics as a Service**
  - Diagnostics online (during model run)
  - Reduced data traffic
  - Diagnostics possible on the computing nodes (using GPUs)
  - New diagnostics (data mining of extremes) possible
  - The user gets the results faster → crucial to adapt to climate change and to develop climate services (public and private)

- **Computing performance is key:** (left) scalability of a ROC area estimate using loadeR, SpecsVerification and easyVerification.
- An RDF-based approach aiming at the reproducibility of objects (NetCDF file, image) with human and machine-readable solution using a semantic metadata model has been created in QA4Seas.





## A new paradigm has come to stay: user-driven research

- **Progress:** opportunities appear in a context where research and services grow closer together.
- **Heterogeneity:** link to and merge our data with communities with larger impact (urban, arts, social).
- **Education:** in the era of open data, take advantage of the open education opportunities.
- **Standards:** in a collaborative environment standards are a must and everyone's (users and providers) responsibility.
- **Technology:** make the most of a rapidly evolving technology (heterogeneous nodes, software, mobile data capture, visualisation, storage/compression, computing and storage outsourcing).
- **Industry engagement:** involved the private sector in improving systems to make them more efficient